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# INTRODUCTION TO SPADES

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Research Scientists,

Pacific Forestry Service, Canadian Forest Service

SpaDES virtual workshop

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June 11-13<sup>th</sup>, 2024



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# OUTLINE

1. What is SpaDES?
2. Why SpaDES
  1. New expectations for (ecological) modellers
  2. R<sup>3</sup>T and PERFICT workflows
3. SpaDES basics



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# BRIEF INTRO TO SPADES

SpaDES is:

- **Spatial Discrete Event System**
- Meta-package in R
- A toolkit/platform
- Modelling standard
- Whatever you can code in R



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## SpaDES is not:

- A (landscape/ecological) model
- The R-equivalent of LANDIS-II
- Necessarily spatially or temporally explicit

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# BRIEF INTRO TO SPADES

MODULARITY

METADATA

NIMBLENESS



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# BRIEF INTRO TO SPADES

MODULARITY

METADATA

NIMBLENESS



WHY DO WE  
NEED/WANT THIS?

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# NEW EXPECTATIONS

## Nimbleness

we must be ready to repeat and adapt analyses/models to new data, new questions/issues and new scientific knowledge

## Broad participation

we must include knowledge and participation from both scientific and non-scientific communities

## Scrutiny

we must accept and embrace scientific and non-scientific scrutiny

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# NEW EXPECTATIONS

- 1. repeatability**
- 2. reproducibility**
- 3. reusability**
- 4. transparency**
- 5. forecasting**
- 6. validation**
- 7. open-data/open-models**
- 8. testing**



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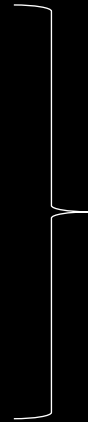
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**R<sup>3</sup>T WORKFLOWS**

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## R<sup>3</sup>T WORKFLOWS

Repeatability ≠ Reproducibility ≠ Reusability

agreement of results obtained by the same individual using same methods

agreement of results obtained by two individuals/groups using same methods

ability to re-use the same methods in a different context  
(e.g. new study area)

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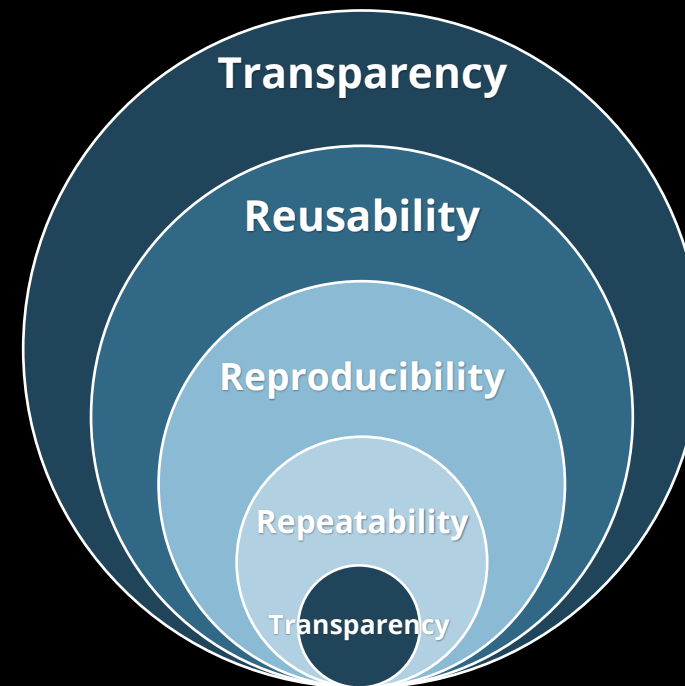
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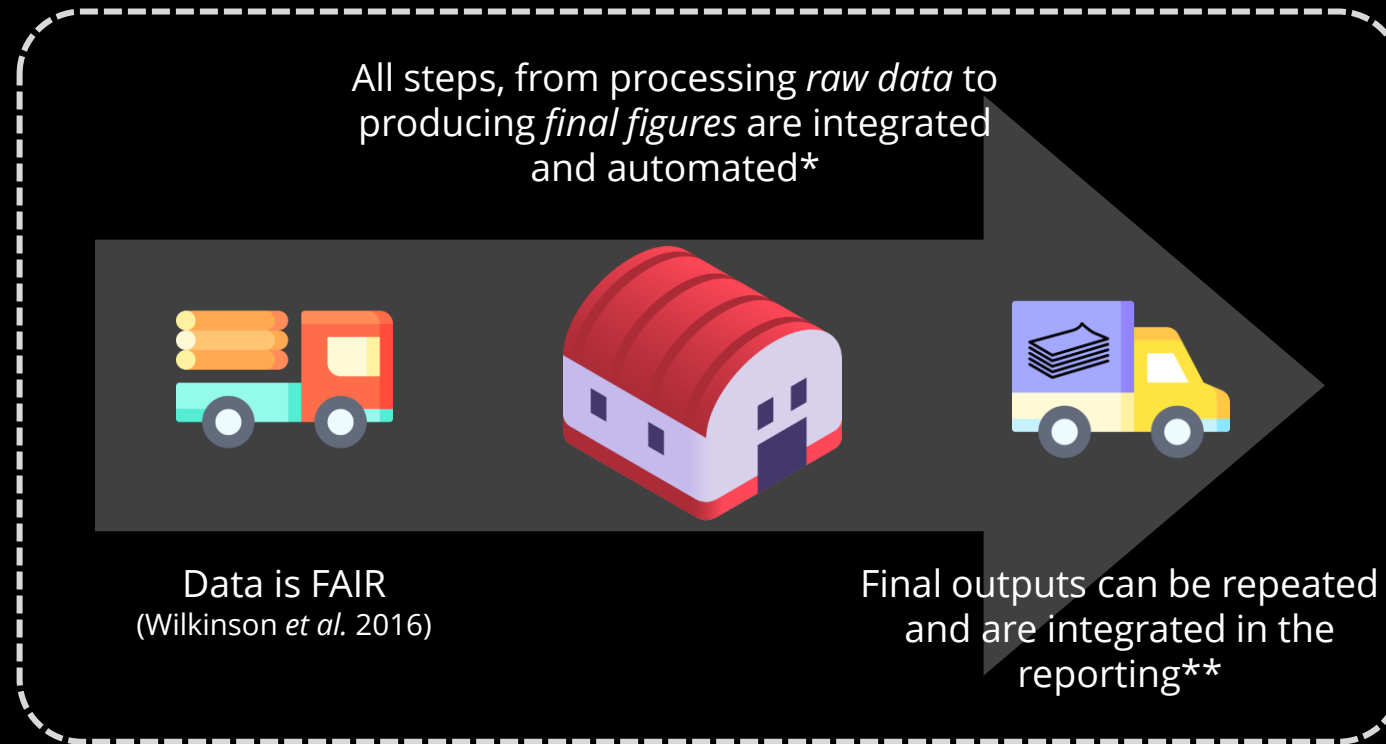
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## R<sup>3</sup>T WORKFLOWS



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# R<sup>3</sup>T WORKFLOWS



Self-contained

\*as much as possible

\*\*directly, or indirectly via links

# NEW EXPECTATIONS

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## R<sup>3</sup>T WORKFLOWS

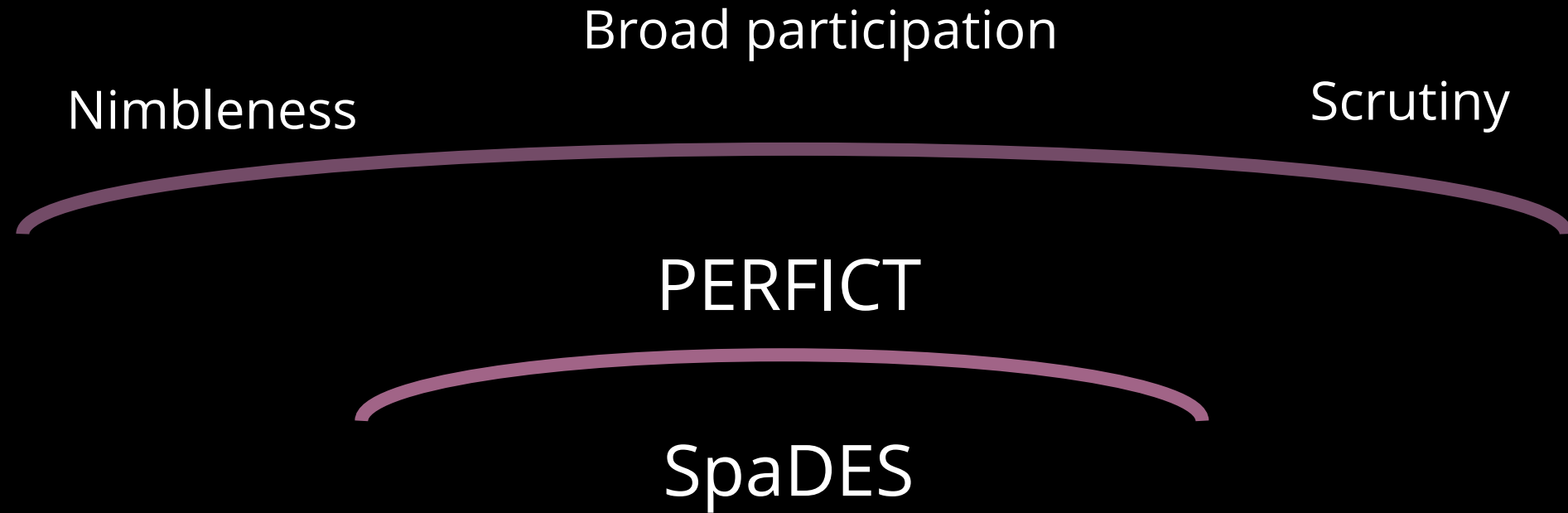
## PERFECT WORKFLOWS



make frequent **P**redictions and **E**valuations of  
**R**eusable, **F**reely accessible, **I**nteroperable  
models, built within **C**ontinuous workflows that  
are routinely **T**ested

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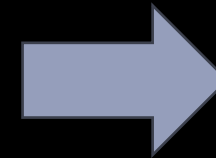
# USING SPADES TO MEET EXPECTATIONS



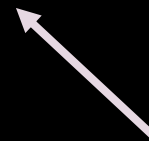


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# SPADES 101

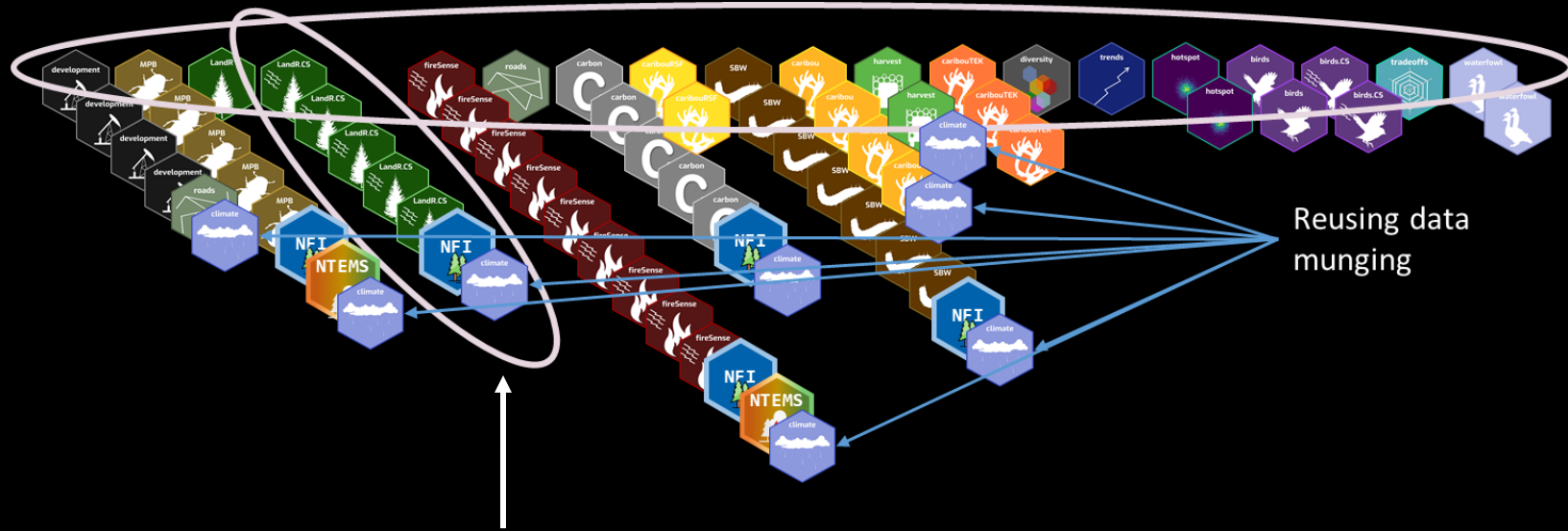


**PERFICT**

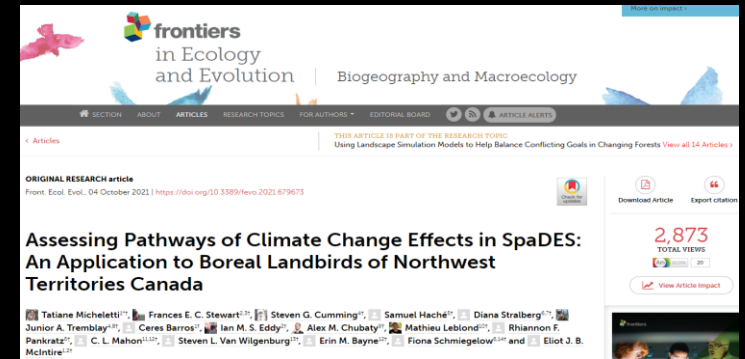


Me before SpaDES

# USING SPADES TO MEET EXPECTATIONS



Reusing data munging



*Horizontal* integration with collaborators across many disciplines and several stakeholders

RESEARCH ARTICLE  
Realising the Promise of Large Data and Complex Models

**Empowering ecological modellers with a PERFICT workflow: Seamlessly linking data, parameterisation, prediction, validation and visualisation**

Ceres Barros<sup>1</sup> | Yong Luo<sup>1,2,3</sup> | Alex M. Chubaty<sup>4</sup> | Ian M. S. Eddy<sup>2</sup> | Tatiane Micheletti<sup>1</sup> | Céline Boisvenue<sup>1,2</sup> | David W. Anderson<sup>5</sup> | Steven G. Cumming<sup>6</sup> | Eliot J. B. McIntire<sup>1,2</sup>

*Vertical* integration with several collaborators/developers



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## SUMMARY

- We are being challenged – accept the challenge!
- R<sup>3</sup>T and PERFICT are principles that (should) permeate our work more and more
- SpaDES is a tool that facilitates the meeting the challenges and expectations we now face
- SpaDES is not a model
- Combining **SpaDES + git + single piece of software** (e.g., R), will take you even further!

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# USEFUL RESOURCES

## Peer-reviewed:

- Barros, C., *et al.* (2023). *Methods Ecol Evol*, 14, 173–188.
- Braga, P.H.P., *et al.* (2023). *Methods in Ecol and Evol*, 14, 1364–1380.
- Brousil, M.R., *et al.* (2023). *Methods in Ecol and Evol*, 14, 1381–1388.
- Ellison, A.M. (2010). *Ecology*, 91, 2536–2539.
- McIntire, E.J.B., *et al.* (2022) *Ecology Letters*. 00:1-7
- Micheletti *et al.* (2021). *Frontiers in Ecology and Evolution*, 9.
- Thomas, R.Q., *et al.* (2023). *Frontiers in Ecology and the Environment*, 21, 112–113.
- Wilkinson, M.D., (2016). *Sci Data*, 3, 160018.

## Reproducible workflows:

Ecological Forecasting Initiative. (2020). *Reproducible Forecasting Workflows*. Ecological Forecasting Initiative. Available at: <https://ecoforecast.org/reproducible-forecasting-workflows/>. Last accessed 6 July 2023.

## The Practice of Reproducible Research

<http://www.practicereproducibleresearch.org/>

## GitHub Quickstart

<https://docs.github.com/en/get-started/quickstart/hello-world>

## Software:

RStudio  
R  
GitKraken  
Git

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# SPADES BASICS

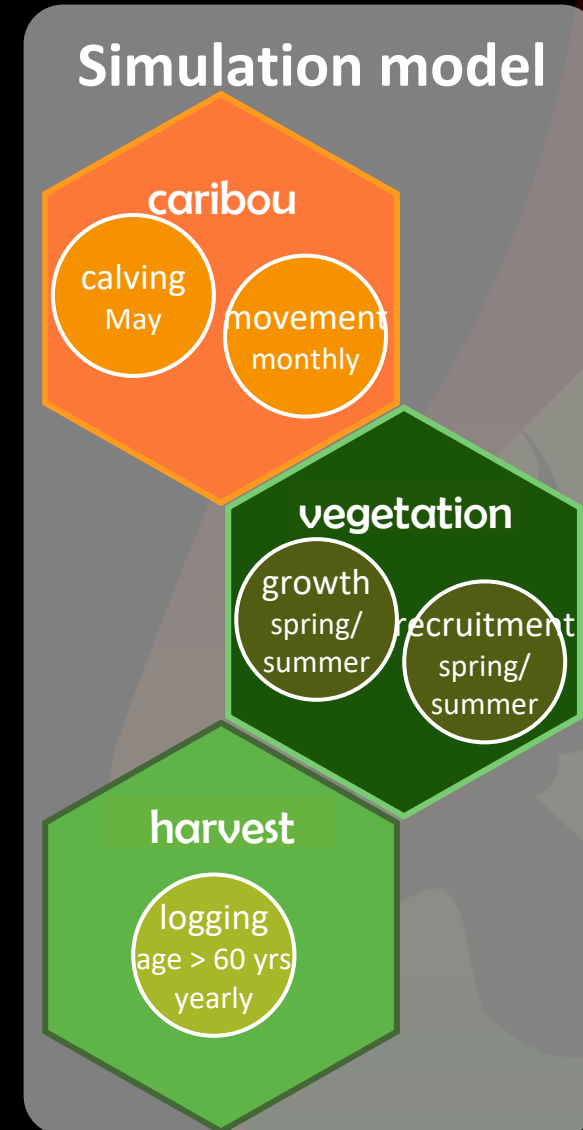
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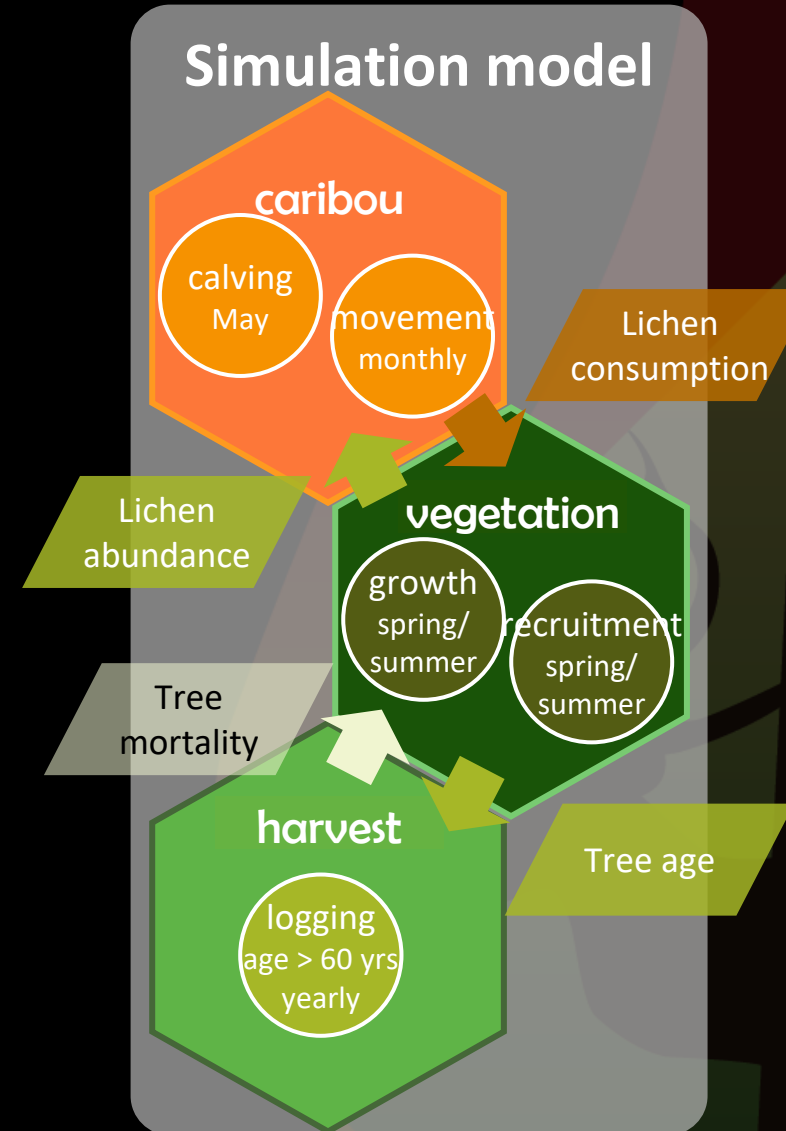
- ✓ Models are composed of interacting *modules*
- ✓ Modules have a known structure and metadata
- ✓ Modules are composed of *events*



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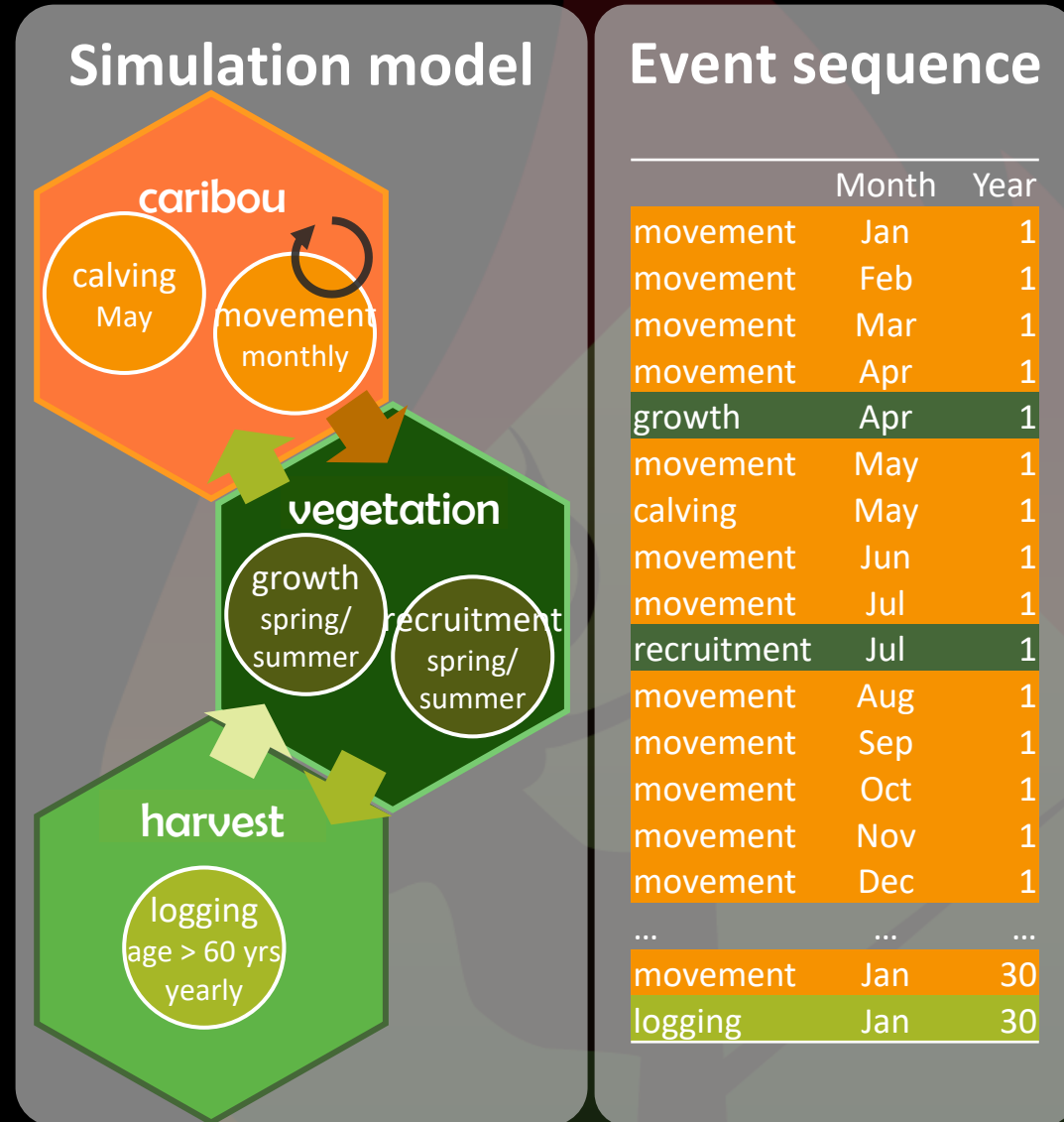
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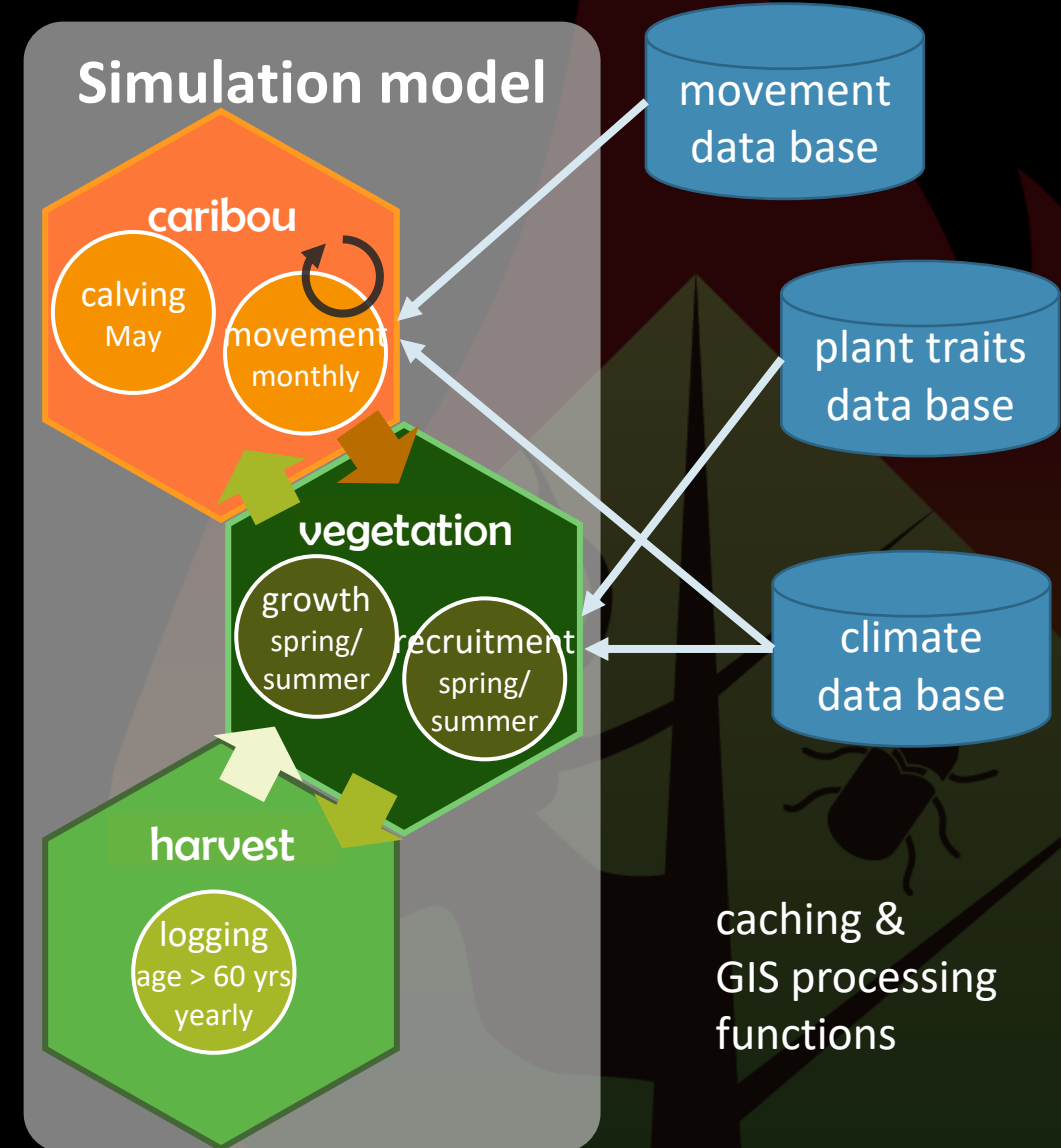
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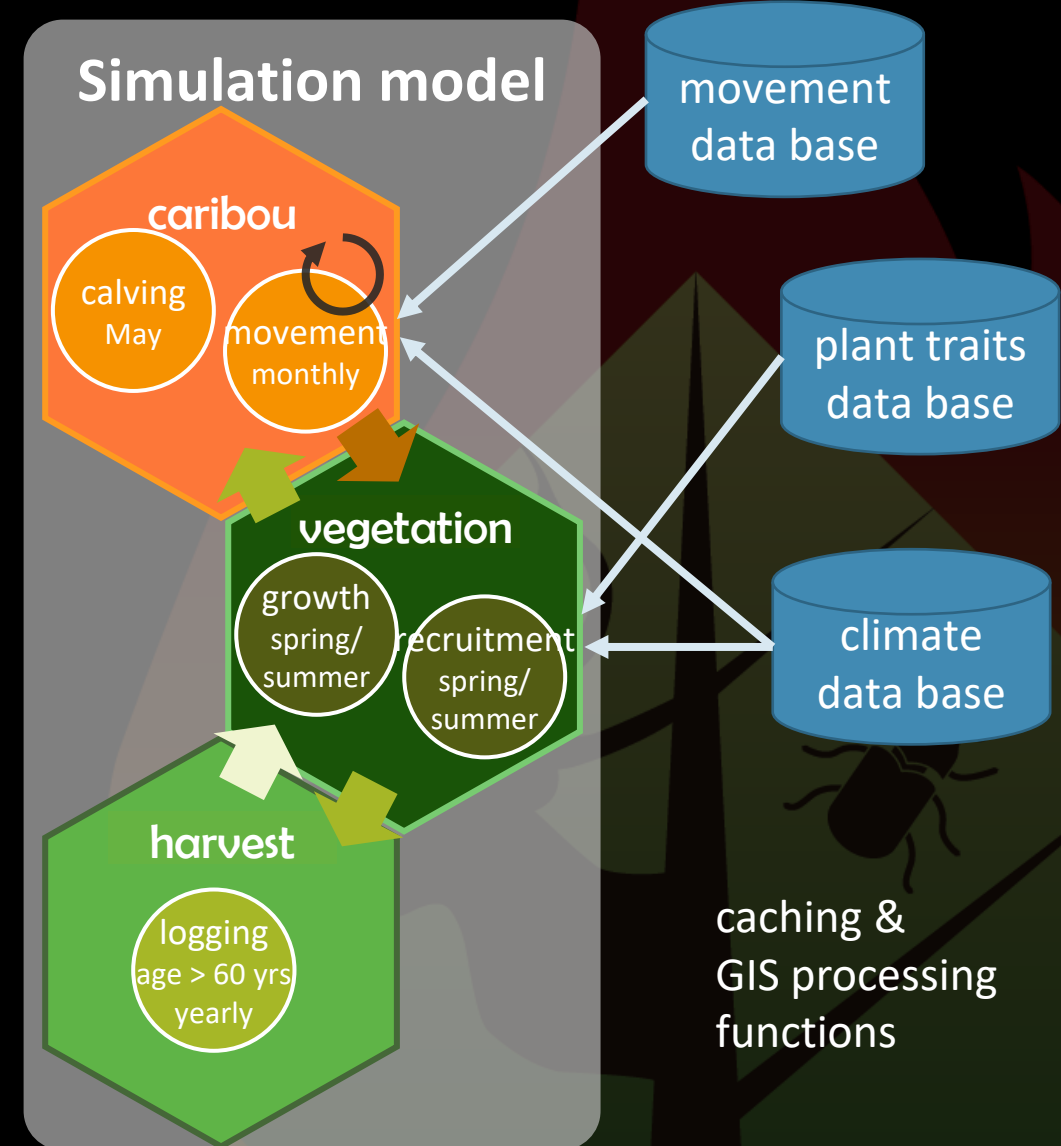
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- ✓ Time units can be as small as seconds – automatic cross-scale scheduling
- ✓ Modules connected directly to (raw) data
- ✓ Time-consuming (and non-stochastic) operations can be cached

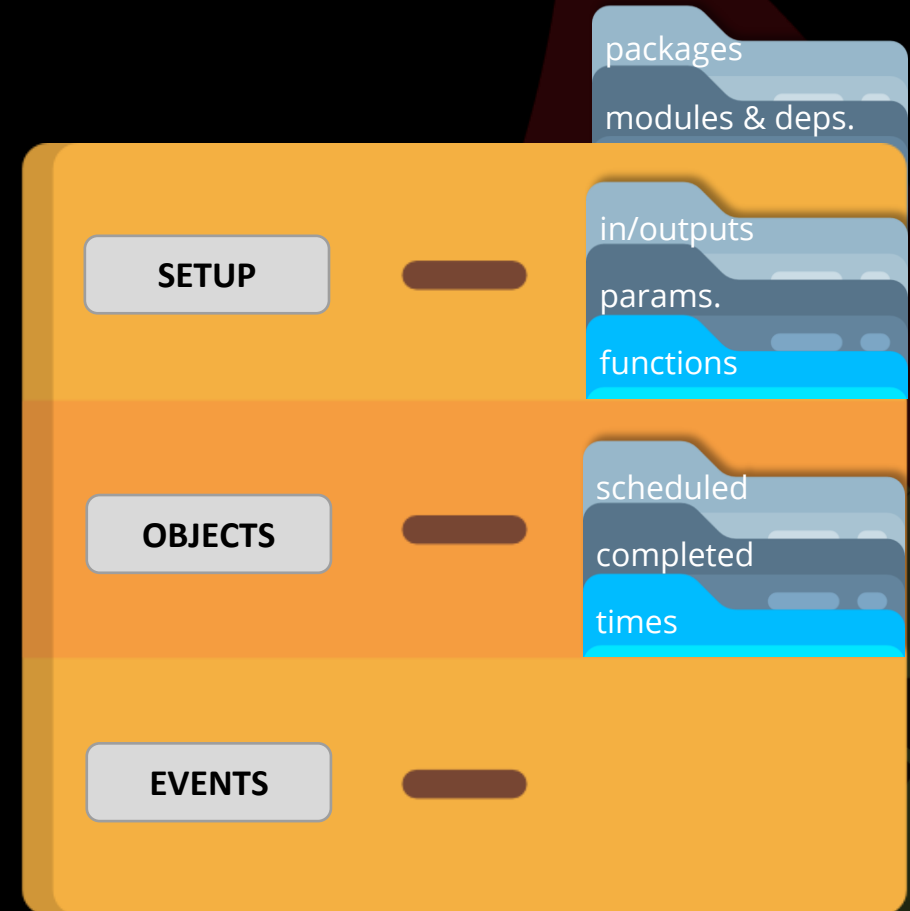


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# SPADES BASICS

- ✓ Everything is contained and accessible via a `simList`

## The `simList`



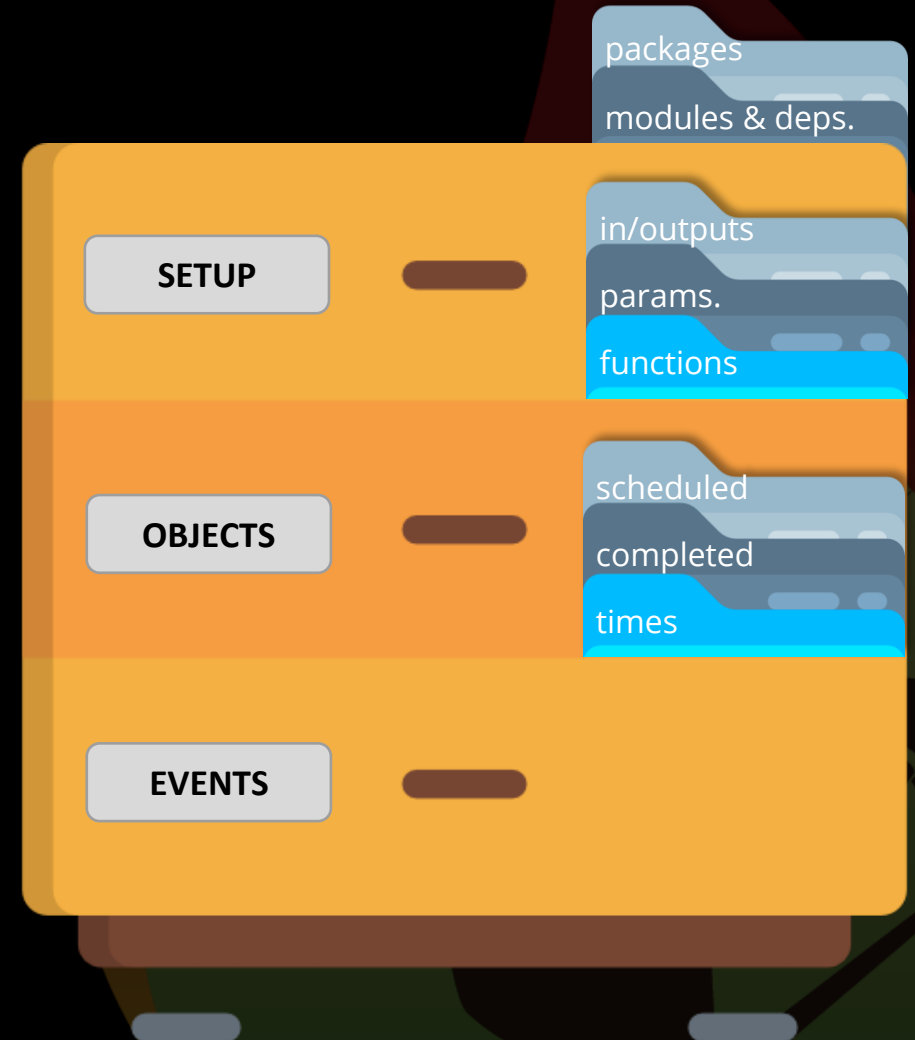
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# SPADES BASICS

- ✓ Everything is contained and accessible via a `simList`
  - ✓ Facilitates inspecting parameters and inputs *a posteriori*
  - ✓ Facilitates tracking uncertainty
  - ✓ + caching = faster development



## The `simList`





# TIME TO LOOK AT SOME CODE



[Robust and nimble scientific workflows, using SpaDES](#)

[Workshop Agenda](#)

This is a *hands-on* workshop

Please **ask questions**, share your troubles and successes

**Last 15 min** of each WOYO is for discussion

We are always available via **Teams chat**